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RESEARCH ARTICLE

# Relationship between occupational dust exposure levels and mental health symptoms among Korean workers

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# **Abstract**

Dust and fumes are complex mixtures of airborne gases and fine particles present in all environments inhabited by people. This study investigated the relationship between occupational dust exposure levels and mental health problems such as depression or anxiety, fatigue, and insomnia or sleep disturbance. We analyzed data from the third and fourth Korean Working Conditions Survey (KWCS) conducted by the Korea Occupational Safety and Health Agency in 2011 and 2014. We performed chi-square tests to compare the different baseline and occupational characteristics and mental health status according to occupational dust exposure levels. The odds ratio (OR) and 95% confidence intervals (95% CIs) for mental health symptoms (fatigue, depression or anxiety, and insomnia or sleep disturbance) were calculated using adjusted multiple logistic regression models. A total of 78,512 participants (43,979 in men, 34,533 in women) were included in this study. Among them, 6,013 (7.7%) and 2,625 (3.3%) reported "moderate" and "severe" dust exposure, respectively. Among those who answered "yes" to depression or anxiety, fatigue, insomnia or sleep disturbance, 50 (4.6%), 961 (4.8%), and 123 (5.9%), respectively, demonstrated "severe" occupational dust exposure. Compared to "low" levels of dust exposure, "moderate" and "severe" exposure increased the risk of depression and anxiety (OR = 1.09, 95%CI: 0.88-1.36; OR = 1.16, 95%CI: 0.87-1.58, per exposure respectively); however, this was not statistically significant. For fatigue, significance was observed for "moderate" 1.54 (1.46–1.64) and "severe" 1.65 (1.52-1.80) exposure levels. "Severe" levels increased the risk of insomnia or sleep disturbance (OR = 1.52, 95%CI: 1.25–1.85). These results suggest that the "dust annoyance" concept of mental health, which may be explained by a neurocognitive mechanism, is plausible. Occupational "dust annoyance" has been linked to workers' mental health status, particularly in terms of fatigue and sleep disturbance; a dose-response relationship has been observed. Workers should be protected against dust to support their health and productivity.



are publicly available from the KCWS database. (http://hdl.handle.net/20.500.12236/23243). The authors do not have any special access privileges.

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**Competing interests:** The authors have declared that no competing interests exist.

## Introduction

Dust and fumes are complex mixtures of airborne gases and fine particles, which arise from various sources, such as soil, pollution, and are present at working and living environments [1, 2]. Most people are frequently exposed to airborne dust, which they inhale daily, and to dust and fumes transported through the troposphere. Dust and fumes are major contributors to environmental pollution, and their concentration has increased in recent decades as a consequence of rapid industrialization and urbanization [3, 4].

Workers can be protected against inspiring particles released in their occupational environment. Previous research has shown that occupational exposure to dust and fumes can lead to diseases, such as heart or lung disease, or respiratory disorder [5–7], among others. Furthermore, occupational exposure to dusts and fumes was classified as a Group 1 carcinogen by the International Agency for Research on Cancer (IARC) [8, 9]. For example, a previous study has found a significant association between occupational exposure to mineral dust and risk of gastric cancer [10].

Moreover, inflammation caused by dust exposure can have deleterious systemic effects, such as ischemic heart disease, respiratory or digestive system dysfunction [11, 12], and chronic dust exposure can lead to chronic inflammation [13, 14]. In turn, chronic inflammation has been shown to affect the mental health, leading to increase in depression and anxiety, by disrupting hormonal regulation [15–18]. However, few studies to-date have reported on the relationship between dust exposure and mental health. Therefore, this study aimed to investigate the relationship between dust exposure levels and mental health.

## Materials and methods

# Study population

We analyzed data from the third and fourth Korean Working Conditions Survey (KWCS) conducted by the Korea Occupational Safety and Health Agency in 2011 and 2014, respectively. The survey methods and structure used in the KWCS are the same as those used by the European Working Condition Survey (EWCS) for comparing working conditions among countries. The population of the KWCS included a representative sample of current Korean workers aged over 15 years, selected from across the country using multistage systematic cluster sampling. We merged the 2011 and 2014 data sets of the KWCS. However, the KWCS participants differed based on the survey year; the survey structure, which is based on the EWCS, and purpose of the survey, which was to include a representative working population from the Republic of Korea, remained the same in both years. The survey involved face-to-face interviews during house visits, which were conducted by trained interviewers. All participants enrolled in the study agreed to participate in further scientific research. All data are accessible at website: 'http://www.kosha.or.kr/kosha/data/primitiveData.do' A total of 100,039 individuals participated in the third and fourth KWCS (n = 50,032 and n = 50,007, respectively). In the present study, we extracted data on adult participants aged 20-65 years, including information regarding education, household income, symptoms, working duration, and other relevant variables. Finally, data from 78,512 participants (43,979 in men, 34,533 in women) were included in this study after excluding those who were out of the range of age (n = 12,740) and those who missed or refused (n = 8,787) (Fig 1).

#### Main variables

The health condition was classified based on self-reported questionnaires, that collected information about symptoms. Depression or anxiety, overall fatigue, and sleep disturbance or



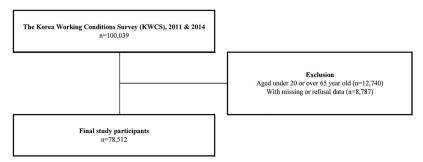


Fig 1. Schematic diagram depicting study population.

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insomnia were assessed by response to the question: "Did you have any of these health problems over the last 12 months?" This question was identical to the question used in the European Working Conditions Survey. Participants who answered "yes" were considered to have experienced some symptoms.

Additionally, participants were asked the following question regarding occupational dust exposure: "Are you exposed to inhalational smoke, fumes (such as welding or exhaust fumes), powder, or dust (such as wood dust or mineral dust) at work?" Participants answered each question based on a seven-point scale, which represented the following answers: "all of the time," "almost all of the time," "around 3/4 of the time," "around half of the time," "around 1/4 of the time," "almost never," and "never". The responses were divided into three categories: "low" (corresponding to "less than 1/4 of the time"), "moderate" ("around half of the time" or "around 3/4 of the time"), and "severe" (more than 3/4 of the time), with daily working hours used as the reference timeframe for exposure.

#### **Covariates**

Potentially confounding variables included gender, age (<40, 40 to 60, and  $\ge$ 60), educational level, and household income, and occupational characteristics, such as type of work, size of enterprise, work schedule, and self-rated job satisfaction. The self-rated health status was also included. The educational level was divided into four categories: elementary school and below, middle school, high school, and college or above. Average monthly income was divided into four groups with intervals of 1,000 U.S. dollars. The type of work was also divided into "paid workers" and "others," which included the self-employed, and participants in non-paying occupations, such as homemaking. The size of enterprise was classified based on <1, 2-4, 5–49, and  $\geq$ 50 workers. Further, we used data on work schedules to identify shift workers, and categorized them into the two following groups based on this information: "shift" and "fixed." Self-rated job satisfaction was divided into three groups based on the answer to the question: "Generally, what do you think about your current job?" The answer "very satisfied" was categorized as "good" job satisfaction, "satisfied" and "not at all satisfied" were into "moderate," and "not very satisfied" was classified as "bad." The self-rated health status was assessed using the question: "How is your health in general?" The responses were grouped as "good" (answers, "very good" and "good"), "moderate" ("fair"), and "bad" ("bad" and "very bad").

#### Statistical analysis

We performed chi-square tests to compare the different baseline and occupational characteristics and mental health status based on occupational dust exposure levels. The odds ratio (OR) and 95% confidence intervals (95% CIs) for having mental health problems (fatigue,



depression or anxiety, and insomnia or sleep disturbance) were calculated using adjusted multiple logistic regression models. Potential confounders for the adjusted logistic model were selected by backward stepwise elimination and based on the findings of previous studies [19, 20]. The final multiple logistic model was adjusted for age, sex, education, income, type of work, size of enterprise, work schedule, self-rated health status, and self-rated job satisfaction level.

The weighted prevalence of each mental health problem was estimated based on exposure hours to occupational dust per week, which was converted from daily to weekly exposure hours of occupational dust. All statistical analyses were completed using SAS version 9.4 (SAS Institute Inc., Cary, NC, USA).

# Results

As shown in Table 1, 69,874 (89.0%), 6,013 (7.7%), and 2,625 (3.3%) participants were exposed to "low," "moderate," and "severe" levels of occupational dust. Among the men, 37,632 (85.6%), 4,294 (9.8%), and 2,053 (4.6%) participants were affected by "low," "moderate," and "severe" levels of exposure, respectively; among women, the corresponding proportions were 32,242 (93.4%), 1,719 (5.0%), and 572 (1.6%), respectively. The highest proportion of study participants by socioeconomic characteristics were aged 40~59 years old (50.0%, n = 39,269), were high school graduates (40.5%, n = 31,824), and had monthly incomes of under \$1,000 (31.4; n = 24,671). In terms of working characteristics, most participants had fixed working schedules (93.4%, n = 79,325) and moderate job satisfaction levels (92.5%, n = 72,599). The prevalence of depression or anxiety, fatigue, and insomnia or sleep disturbance was 1.4% (n = 1,089), 25.8% (n = 20,276), and 2.6% (n = 2,071), respectively. Those who answered, "yes" to depression or anxiety showed a significant difference across "low" (946; 86.9%), "moderate" (93; 8.5%), and "severe" (50; 4.6%) exposure levels. Those who answered, "yes" to fatigue showed a significant difference across "low" (17,200; 84.8%), "moderate" (2,115; 10.4%), and "severe" (961; 4.8%) levels. Those who answered "yes" to insomnia or sleep disturbance showed a significant difference across "low" (1,783; 86.1%), "moderate" (165; 8.0%), and "severe" (123; 5.9%) exposure levels.

Table 2 demonstrates the results of logistic regression in terms of depression or anxiety for "moderate" (1.09 [0.88–1.36]) and "severe" (1.16 [0.87–1.58]) dust exposure levels when the reference was set to "low". When the "low" exposure group was set as the reference for fatigue, the "moderate" (1.54 [1.46–1.64]) and "severe" (1.65 [1.52–1.80]) groups showed significant results. In terms of insomnia or sleep disturbance, the results were significant in the "moderate" (0.99 [0.84–1.16]) and "severe" (1.52 [1.25–1.85]) groups. The weighted prevalence and linear trends of each mental health symptom according to the exposure hours to occupational dust per week are shown in Fig 2. The linearity in fatigue and insomnia or sleep disturbance indicated the existence of a dose-response relationship.

#### **Discussion**

This study investigated the relationship between occupational dust exposure and workers' mental health, showing an association between symptoms such as fatigue, insomnia or sleep disturbance, and exposure to "moderate" and "severe" levels of dust. These relationships remained when data were adjusted for socio-demographic and occupational characteristics such as age, sex, education, income, and type of work, size of enterprise, work schedule, self-rated health status, and self-rated job satisfaction. Furthermore, the results revealed a dose-response relationship between exposure and outcomes of interest. Therefore, the longer and more pronounced the exposure to dust, the higher was the frequency of mental health



Table 1. Baseline study participants (n = 78,512) according to occupational dust exposure level.

Total subjects   Paris		Total participants n(% of		Occupational dust exposure*, n(% of row)						
Sex   Men										
Mome   A3,879   S6,0   37,632   85,6   4,294   9,8   2,053   4,6	Total subjects	78.512	100.0	69,874	89.0	6,013	7.7	2,625	3.3	
Nome	Sex									
Age          Column (1)         Column (2)	Men	43.979	56.0	37,632	85.6	4,294	9.8	2,053	4.6	
Color	Women	34.533	44.0	32,242	93.4	1,719	5.0	572	1.6	
Section   Sec	Age									
Education	<40	25,432	32.4	23,448	92.2	1,369	5.4	615	2.4	
Elementary school	<60	39,269	50.0	34,580	88.1	3,169	8.1	1,520	3.8	
Elementary school   7,517   9,6   6,310   83.9   854   11.4   353   4.7	≥60	13,811	17.6	11,846	85.8	1,475	10.7	490	3.5	
Middle school         7,428         9.5         6,173         83.1         847         11.4         408         5.5           High school         31,824         40.5         27,384         86.1         3,057         9.6         1,383         4.3           University         31,743         40.4         30,007         94.5         1,255         3.9         481         1.6           Monthly income (s)         1         2,000         14,613         118.6         13,060         88.7         1,1947         7.9         838         3.4           <2,000	Education									
High school   31,824   40.5   27,384   86.1   3,057   9.6   1,383   4.3	Elementary school	7,517	9.6	6,310	83.9	854	11.4	353	4.7	
University   31,743   40.4   30,007   94.5   1,255   3.9   481   1.6	Middle school	7,428	9.5	6,173	83.1	847	11.4	408	5.5	
Monthly income (\$)	High school	31,824	40.5	27,384	86.1	3,057	9.6	1,383	4.3	
<1,000         24,671         31.4         21,886         88.7         1,947         7.9         838         3.4           <2,000         14,613         18.6         13,060         89.4         1,114         7.6         439         3.0           ≥3,000         21,014         26.8         18,525         88.2         1,692         8.0         797         3.8           ≥3,000         18,214         23.2         16,403         90.1         1,260         6.9         551         3.0           Type of work         Paid workers         49,289         62.8         43,764         88.8         3,624         7.4         1,901         3.8           Self-employed and other         29,223         37.2         26,110         89.3         2,389         8.2         724         2.5           Size of enterprise         1         19,883         25.3         17,581         88.4         1,767         9.0         535         2.6             4         19,883         25.3         17,715         91.0         1,287         6.6         460         2.4             26,220         33.4         23,262         88.7         1,980 <td>University</td> <td>31,743</td> <td>40.4</td> <td>30,007</td> <td>94.5</td> <td>1,255</td> <td>3.9</td> <td>481</td> <td>1.6</td>	University	31,743	40.4	30,007	94.5	1,255	3.9	481	1.6	
<2,000       14,613       18.6       13,060       89.4       1,114       7.6       439       3.0         <3,000       21,014       26.8       18,525       88.2       1,692       8.0       797       3.8         ≥3,000       18,214       23.2       16,403       90.1       1,260       6.9       551       3.0         Type of work         Paid workers       49,289       62.8       43,764       88.8       3,624       7.4       1,901       3.8         Self-employed and other       29,223       37.2       26,110       89.3       2,389       8.2       724       2.5         Size of enterprise       1       19,883       25.3       17,581       88.4       1,767       9.0       535       2.6         <50       19,462       24.8       17,715       91.0       1,287       6.6       460       2.4         <50       26,20       33.4       23,262       88.7       1,980       7.6       978       3.7         Work schedule       5,187       6.6       4,443       85.7       448       8.6       296       5.7         Fixed       73,325       93.4	Monthly income (\$)									
Size of enterprise	<1,000	24,671	31.4	21,886	88.7	1,947	7.9	838	3.4	
≥3,000   18,214   23,2   16,403   90.1   1,260   6.9   551   3.0	<2,000	14,613	18.6	13,060	89.4	1,114	7.6	439	3.0	
Type of work         Paid workers         49,289         62,8         43,764         88,8         3,624         7,4         1,901         3,8           Self-employed and other         29,223         37,2         26,110         89,3         2,389         8,2         724         2.5           Size of enterprise         1         19,883         25,3         17,581         88,4         1,767         9,0         535         2,6           <5	<3,000	21,014	26.8	18,525	88.2	1,692	8.0	797	3.8	
Paid workers         49,289         62.8         43,764         88.8         3,624         7.4         1,901         3.8           Self-employed and other         29,223         37.2         26,110         89.3         2,389         8.2         724         2.5           Size of enterprise         1         19,883         25.3         17,581         88.4         1,767         9.0         535         2.6           <5	≥3,000	18,214	23.2	16,403	90.1	1,260	6.9	551	3.0	
Self-employed and other         29,223         37.2         26,110         89,3         2,389         8.2         724         2.5           Size of enterprise         1         19,883         25.3         17,581         88.4         1,767         9.0         535         2.6           <5	Type of work									
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1       19,883       25.3       17,581       88.4       1,767       9.0       535       2.6         <5	Self-employed and other	29,223	37.2	26,110	89.3	2,389	8.2	724	2.5	
<5       19,462       24.8       17,715       91.0       1,287       6.6       460       2.4         <50       26,220       33.4       23,262       88.7       1,980       7.6       978       3.7         ≥50       12,947       16.5       11,316       87.4       979       9.6       652       5.0         Work schedule       Shift       5,187       6.6       4,443       85.7       448       8.6       296       5.7         Fixed       73,325       93.4       65,431       89.2       5,565       7.6       2,329       3.2         Self-rated health status       Good       52,826       67.3       47,555       90.0       3,651       6.9       1,620       3.1         Moderate       21,580       27.5       18,921       87.7       1,907       8.8       752       3.5         Self-rated job satisfaction       82.8       455       11.0       253       6.2         Self-rated job satisfaction       Good       4,242       5.4       4,055       95.6       143       3.4       44       1.0         Moderate       72,599       92.5       64,555       88.9       5,663	Size of enterprise									
<50         26,220         33.4         23,262         88.7         1,980         7.6         978         3.7           ≥50         12,947         16.5         11,316         87.4         979         9.6         652         5.0           Work schedule           Shift         5,187         6.6         4,443         85.7         448         8.6         296         5.7           Fixed         73,325         93.4         65,431         89.2         5,565         7.6         2,329         3.2           Self-rated health status         Self-rated health status           Good         52,826         67.3         47,555         90.0         3,651         6.9         1,620         3.1           Moderate         21,580         27.5         18,921         87.7         1,907         8.8         752         3.5           Bad         4,106         5.2         3,398         82.8         455         11.0         253         6.2           Self-rated job satisfaction           Good         4,242         5.4         4,055         95.6         143         3.4         44 </td <td>1</td> <td>19,883</td> <td>25.3</td> <td>17,581</td> <td>88.4</td> <td>1,767</td> <td>9.0</td> <td>535</td> <td>2.6</td>	1	19,883	25.3	17,581	88.4	1,767	9.0	535	2.6	
≥50   12,947   16.5   11,316   87.4   979   9.6   652   5.0	<5	19,462	24.8	17,715	91.0	1,287	6.6	460	2.4	
Work schedule         Shift         5,187         6.6         4,443         85.7         448         8.6         296         5.7           Fixed         73,325         93.4         65,431         89.2         5,565         7.6         2,329         3.2           Self-rated health status	<50	26,220	33.4	23,262	88.7	1,980	7.6	978	3.7	
Shift         5,187         6.6         4,443         85.7         448         8.6         296         5.7           Fixed         73,325         93.4         65,431         89.2         5,565         7.6         2,329         3.2           Self-rated health status         Good         52,826         67.3         47,555         90.0         3,651         6.9         1,620         3.1           Moderate         21,580         27.5         18,921         87.7         1,907         8.8         752         3.5           Bad         4,106         5.2         3,398         82.8         455         11.0         253         6.2           Self-rated job satisfaction         Good         4,242         5.4         4,055         95.6         143         3.4         44         1.0           Moderate         72,599         92.5         64,555         88.9         5,663         7.8         2,381         3.3           Bad         1,671         2.1         1,264         75.6         207         12.4         200         12.0           Depression or anxiety         Yes         1,089         1.4         946         86.9	≥50	12,947	16.5	11,316	87.4	979	9.6	652	5.0	
Fixed         73,325         93.4         65,431         89.2         5,565         7.6         2,329         3.2           Self-rated health status         Good         52,826         67.3         47,555         90.0         3,651         6.9         1,620         3.1           Moderate         21,580         27.5         18,921         87.7         1,907         8.8         752         3.5           Bad         4,106         5.2         3,398         82.8         455         11.0         253         6.2           Self-rated job satisfaction         Good         4,242         5.4         4,055         95.6         143         3.4         44         1.0           Moderate         72,599         92.5         64,555         88.9         5,663         7.8         2,381         3.3           Bad         1,671         2.1         1,264         75.6         207         12.4         200         12.0           Depression or anxiety         Yes         1,089         1.4         946         86.9         93         8.5         50         4.6           No         77,423         98.6         68,928         89.0         5,920         7.7 <td< td=""><td>Work schedule</td><td></td><td></td><td></td><td></td><td></td><td></td><td></td><td></td></td<>	Work schedule									
Self-rated health status         Good         52,826         67.3         47,555         90.0         3,651         6.9         1,620         3.1           Moderate         21,580         27.5         18,921         87.7         1,907         8.8         752         3.5           Bad         4,106         5.2         3,398         82.8         455         11.0         253         6.2           Self-rated job satisfaction         Good         4,242         5.4         4,055         95.6         143         3.4         44         1.0           Moderate         72,599         92.5         64,555         88.9         5,663         7.8         2,381         3.3           Bad         1,671         2.1         1,264         75.6         207         12.4         200         12.0           Depression or anxiety         Yes         1,089         1.4         946         86.9         93         8.5         50         4.6           No         77,423         98.6         68,928         89.0         5,920         7.7         2,575         3.3           Fatigue         Yes         20,276         25.8         17,200         84.8	Shift	5,187	6.6	4,443	85.7	448	8.6	296	5.7	
Good         52,826         67.3         47,555         90.0         3,651         6.9         1,620         3.1           Moderate         21,580         27.5         18,921         87.7         1,907         8.8         752         3.5           Bad         4,106         5.2         3,398         82.8         455         11.0         253         6.2           Self-rated job satisfaction         600         4,242         5.4         4,055         95.6         143         3.4         44         1.0           Moderate         72,599         92.5         64,555         88.9         5,663         7.8         2,381         3.3           Bad         1,671         2.1         1,264         75.6         207         12.4         200         12.0           Depression or anxiety         Yes         1,089         1.4         946         86.9         93         8.5         50         4.6           No         77,423         98.6         68,928         89.0         5,920         7.7         2,575         3.3           Fatigue         Yes         20,276         25.8         17,200         84.8         2,115         10.4	Fixed	73,325	93.4	65,431	89.2	5,565	7.6	2,329	3.2	
Moderate         21,580         27.5         18,921         87.7         1,907         8.8         752         3.5           Bad         4,106         5.2         3,398         82.8         455         11.0         253         6.2           Self-rated job satisfaction         Good         4,242         5.4         4,055         95.6         143         3.4         44         1.0           Moderate         72,599         92.5         64,555         88.9         5,663         7.8         2,381         3.3           Bad         1,671         2.1         1,264         75.6         207         12.4         200         12.0           Depression or anxiety         Yes         1,089         1.4         946         86.9         93         8.5         50         4.6           No         77,423         98.6         68,928         89.0         5,920         7.7         2,575         3.3           Fatigue         Yes         20,276         25.8         17,200         84.8         2,115         10.4         961         4.8           Insomnia or sleep disturbance         Yes         2,071         2.6         1,783	Self-rated health status									
Bad         4,106         5.2         3,398         82.8         455         11.0         253         6.2           Self-rated job satisfaction         Good         4,242         5.4         4,055         95.6         143         3.4         44         1.0           Moderate         72,599         92.5         64,555         88.9         5,663         7.8         2,381         3.3           Bad         1,671         2.1         1,264         75.6         207         12.4         200         12.0           Depression or anxiety         Yes         1,089         1.4         946         86.9         93         8.5         50         4.6           No         77,423         98.6         68,928         89.0         5,920         7.7         2,575         3.3           Fatigue         Yes         20,276         25.8         17,200         84.8         2,115         10.4         961         4.8           No         58,236         74.2         52,674         90.5         3,898         6.7         1,664         2.8           Insomnia or sleep disturbance         Yes         2,071         2.6         1,783         86.1         165         8.0	Good	52,826	67.3	47,555	90.0	3,651	6.9	1,620	3.1	
Self-rated job satisfaction         Good         4,242         5.4         4,055         95.6         143         3.4         44         1.0           Moderate         72,599         92.5         64,555         88.9         5,663         7.8         2,381         3.3           Bad         1,671         2.1         1,264         75.6         207         12.4         200         12.0           Depression or anxiety         Yes         1,089         1.4         946         86.9         93         8.5         50         4.6           No         77,423         98.6         68,928         89.0         5,920         7.7         2,575         3.3           Fatigue         Yes         20,276         25.8         17,200         84.8         2,115         10.4         961         4.8           Insomnia or sleep disturbance         Yes         2,071         2.6         1,783         86.1         165         8.0         123         5.9	Moderate	21,580	27.5	18,921	87.7	1,907	8.8	752	3.5	
Good         4,242         5.4         4,055         95.6         143         3.4         44         1.0           Moderate         72,599         92.5         64,555         88.9         5,663         7.8         2,381         3.3           Bad         1,671         2.1         1,264         75.6         207         12.4         200         12.0           Depression or anxiety         Yes         1,089         1.4         946         86.9         93         8.5         50         4.6           No         77,423         98.6         68,928         89.0         5,920         7.7         2,575         3.3           Fatigue         Yes         20,276         25.8         17,200         84.8         2,115         10.4         961         4.8           No         58,236         74.2         52,674         90.5         3,898         6.7         1,664         2.8           Insomnia or sleep disturbance         Yes         2,071         2.6         1,783         86.1         165         8.0         123         5.9	Bad	4,106	5.2	3,398	82.8	455	11.0	253	6.2	
Moderate         72,599         92.5         64,555         88.9         5,663         7.8         2,381         3.3           Bad         1,671         2.1         1,264         75.6         207         12.4         200         12.0           Depression or anxiety         Yes         1,089         1.4         946         86.9         93         8.5         50         4.6           No         77,423         98.6         68,928         89.0         5,920         7.7         2,575         3.3           Fatigue         Yes         20,276         25.8         17,200         84.8         2,115         10.4         961         4.8           No         58,236         74.2         52,674         90.5         3,898         6.7         1,664         2.8           Insomnia or sleep disturbance         Yes         2,071         2.6         1,783         86.1         165         8.0         123         5.9	Self-rated job satisfaction									
Bad         1,671         2.1         1,264         75.6         207         12.4         200         12.0           Depression or anxiety         Yes         1,089         1.4         946         86.9         93         8.5         50         4.6           No         77,423         98.6         68,928         89.0         5,920         7.7         2,575         3.3           Fatigue         Yes         20,276         25.8         17,200         84.8         2,115         10.4         961         4.8           No         58,236         74.2         52,674         90.5         3,898         6.7         1,664         2.8           Insomnia or sleep disturbance         Yes         2,071         2.6         1,783         86.1         165         8.0         123         5.9	Good	4,242	5.4	4,055	95.6	143	3.4	44	1.0	
Depression or anxiety         Yes         1,089         1.4         946         86.9         93         8.5         50         4.6           No         77,423         98.6         68,928         89.0         5,920         7.7         2,575         3.3           Fatigue         Yes         20,276         25.8         17,200         84.8         2,115         10.4         961         4.8           No         58,236         74.2         52,674         90.5         3,898         6.7         1,664         2.8           Insomnia or sleep disturbance         Yes         2,071         2.6         1,783         86.1         165         8.0         123         5.9	Moderate	72,599	92.5	64,555	88.9	5,663	7.8	2,381	3.3	
Yes         1,089         1.4         946         86.9         93         8.5         50         4.6           No         77,423         98.6         68,928         89.0         5,920         7.7         2,575         3.3           Fatigue         Yes         20,276         25.8         17,200         84.8         2,115         10.4         961         4.8           No         58,236         74.2         52,674         90.5         3,898         6.7         1,664         2.8           Insomnia or sleep disturbance         Yes         2,071         2.6         1,783         86.1         165         8.0         123         5.9	Bad	1,671	2.1	1,264	75.6	207	12.4	200	12.0	
No         77,423         98.6         68,928         89.0         5,920         7.7         2,575         3.3           Fatigue         Yes         20,276         25.8         17,200         84.8         2,115         10.4         961         4.8           No         58,236         74.2         52,674         90.5         3,898         6.7         1,664         2.8           Insomnia or sleep disturbance         Yes         2,071         2.6         1,783         86.1         165         8.0         123         5.9	Depression or anxiety									
Fatigue         Yes         20,276         25.8         17,200         84.8         2,115         10.4         961         4.8           No         58,236         74.2         52,674         90.5         3,898         6.7         1,664         2.8           Insomnia or sleep disturbance         Yes         2,071         2.6         1,783         86.1         165         8.0         123         5.9	Yes	1,089	1.4	946	86.9	93	8.5	50	4.6	
Yes         20,276         25.8         17,200         84.8         2,115         10.4         961         4.8           No         58,236         74.2         52,674         90.5         3,898         6.7         1,664         2.8           Insomnia or sleep disturbance         Yes         2,071         2.6         1,783         86.1         165         8.0         123         5.9	No	77,423	98.6	68,928	89.0	5,920	7.7	2,575	3.3	
No         58,236         74.2         52,674         90.5         3,898         6.7         1,664         2.8           Insomnia or sleep disturbance         Yes         2,071         2.6         1,783         86.1         165         8.0         123         5.9	Fatigue									
Insomnia or sleep disturbance         Yes         2,071         2.6         1,783         86.1         165         8.0         123         5.9	Yes	20,276	25.8	17,200	84.8	2,115	10.4	961	4.8	
Yes         2,071         2.6         1,783         86.1         165         8.0         123         5.9	No	58,236	74.2	52,674	90.5	3,898	6.7	1,664	2.8	
	Insomnia or sleep disturbance									
No 76,441 97.4 68,091 89.1 5,848 7.6 2,502 3.3	Yes	2,071	2.6	1,783	86.1	165	8.0	123	5.9	
	No	76,441	97.4	68,091	89.1	5,848	7.6	2,502	3.3	

 $<sup>^*</sup>$ Occupational dust exposure level was categorized by exposure time of daily work hours; low (<50%), moderate ( $50\sim75\%$ ), and severe (>75%)

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Table 2. Results of odds ratio (OR) and 95% confidence intervals (CI) according to occupational dust exposure level by logistic regression model.

	Occupational dust exposure*, OR (95% CI)									
	Low	Moderate			P for trend					
Depression or anxiety	Reference	1.09	(0.88-1.36)	1.16	(0.87-1.58)	0.2062				
Fatigue	Reference	1.54	(1.46-1.64)	1.65	(1.52-1.80)	< .0001				
Insomnia or sleep disturbance	Reference	0.99	(0.84-1.16)	1.52	(1.25-1.85)	0.0010				

<sup>\*</sup>Occupational dust exposure level was categorized by exposure time of daily work hours; low (<50%), moderate (50~75%), and severe (>75%)
All models are adjusted age, sex, education, income, type of work, size of enterprise, work schedule, self-rated health status, and self-rated job satisfaction level.

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symptoms such as fatigue and insomnia, among surveyed workers. However, the incidence of depression or anxiety was not affected by dust exposure. This finding is inconsistent with that of a previous study on past occupational dust exposure among retired Chinese factory workers, where depressive symptoms and anxiety were associated with dust exposure [21].

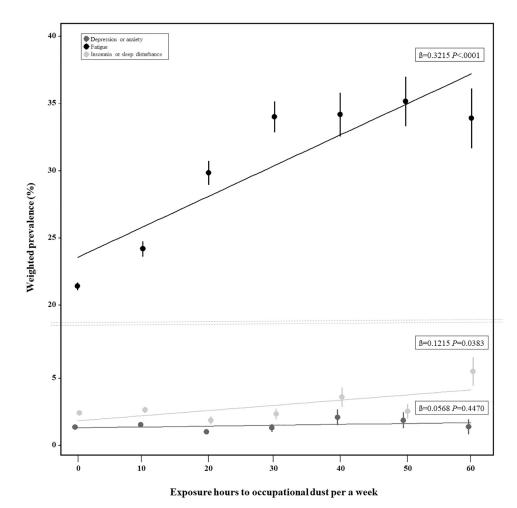


Fig 2. Weighed prevalence and trend of depression or anxiety, fatigue, and insomnia or sleep disturbance in the Korean workers according to exposure hours to occupational dust per a week. (All working hours are estimated 60 hours per a week).

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An inflammatory response is considered to be the basis for the pathogenesis of various diseases. A significant number of previous studies have focused on elucidating the link between dust exposure and airway inflammation [22–25]. While dust inhalation can cause local inflammation of the airways, other research has shown that it can also lead to systemic inflammation, whereby the inhaled dust enters blood circulation, resulting in oxidative stress and subsequent systemic inflammation [26, 27]. Elevated inflammatory markers have also been found to be closely associated with psychiatric disorders such as major depression [28], anxiety [29], and bipolar disorder [30]. In addition, further studies have shown a relationship between inflammation and symptoms consistent with mental illness, including sleep disturbance and fatigue [31, 32]. A current hypothesis proposed as an explanation for the influence of dust exposure on mental health suggests that inflammation (local or systemic) caused by inhaled dust may be prolonged and may become chronic, resulting in psychiatric problems.

Similar to the mechanism whereby noise annoyance may lead to psychological problems by provoking sustained central autonomic arousal and disruption of the dopamine pathway [33], occupational dust exposure may lead to mental health problems by triggering sustained nervous stimulation, which is associated with cortical activation. The impact of dust exposure on mental health may therefore be referred to as "dust annoyance."

The concept of "dust annoyance" in mental health may be explained by a neurocognitive mechanism. The predisposing factors, such as stressors at the workplace, which are associated with somatic, cognitive, or cortical activation, are closely linked to perpetuating factors such as extension of time in bed due to obstacles to de-arousal from cortical arousal [34]. The concept proposes that "dust annoyance" could continually increase cortical arousal, leading to mental health deterioration, which ranges from symptoms of fatigue and sleep disturbance to depression or anxiety; the current results are in agreement with this concept.

The present study has several limitations. First, owing to the cross-sectional study design, the results indicate an association between "dust annoyance" and the mental health of workers; no conclusions may therefore be drawn with respect to causality. Nevertheless, a biological gradient, which constitutes one of Hill's criteria for causality [35], was detected in our analysis, which indicates that the reported association was causal. However, any such association should be interpreted with caution as most dose-response curves are non-linear owing to complex factors that affect the shape of the curve [36]. Second, as our study was based on self-reported symptoms from questionnaire data, which relies on the accuracy of participants' memory, there was a possibility of recall bias. In addition, the mental health status surveyed in the present study, such as depression or anxiety, fatigue, and insomnia or sleep disturbance was based on self-reported information; therefore, any suspected or reported psychopathologies did not necessarily meet the diagnostic criteria for particular medical conditions.

Third, the type and quantity of inhaled dust was not assessed quantitatively owing to a lack of relevant data. As these factors may have distinct health effects, prospective studies are needed to elucidate the dose-response phenomenon more clearly. Furthermore, we evaluated the mental health status with particular focus on occupational dust exposure levels without considering other health behaviors such as smoking, alcohol drinking, or exercise. Mental health is known to be closely related with health behavior [37]. Unfortunately, health behavioral factors linked to mental health were not accessible owing to the nature of the KWCS data. Lastly, we used occupational dust exposed levels during the working period as the main risk factor for mental health. However, we could not evaluate the conditions during the entire working period, that may have had an adverse impact on the mental health of workers. In this cohort, workers' mental health was closely related with exposure to multiple occupational risk factors at the workplace [38]. Unfortunately, this study does not reflect the conditions of the entire working period. Further studies are needed to investigate this important issue.



# Conclusion

In conclusion, occupational "dust annoyance" in this cohort was linked to workers' mental health status, particularly with fatigue and sleep disturbance, indicating a dose-response relationship. Since conditions such as fatigue and sleep disturbance may decrease work efficiency and lead to injuries at workplaces, it is essential to limit dust exposure in work environments, and to provide personal protective gear to workers.

#### **Author Contributions**

Conceptualization: Wanhyung Lee, Jin-Ha Yoon, June-Hee Lee.

Data curation: Wanhyung Lee, Jin-Ha Yoon, June-Hee Lee.

Formal analysis: Wanhyung Lee.

Investigation: Jae-Gwang Lee, Jin-Ha Yoon.

Methodology: Wanhyung Lee, Jin-Ha Yoon, June-Hee Lee.

Resources: Jae-Gwang Lee.

Supervision: Jin-Ha Yoon, June-Hee Lee.

Validation: Jae-Gwang Lee, Jin-Ha Yoon, June-Hee Lee.

Writing – original draft: Wanhyung Lee, Jae-Gwang Lee, June-Hee Lee.
Writing – review & editing: Jae-Gwang Lee, Jin-Ha Yoon, June-Hee Lee.

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